Laplacian Growth and Random Matrices

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- Mihai Putinar (UCSB)

Matrices in physics - random history

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Area law: $t_0 = r^2 - \sum_k k|u_k|^2$

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- Complex curve $f(z,\zeta)=0$, $\Gamma:\zeta=\bar{z}$ Schottky double

Classical variational formulation

Laplacian Growth ...

Laplacian Growth: constrained variational problem

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$$\int f(z)\rho(z)d^2z = \int f(z)\rho_s(z)d^2z, \quad f(z) \text{ integrable}$$

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Normal matrices and LG: a physicist's proof

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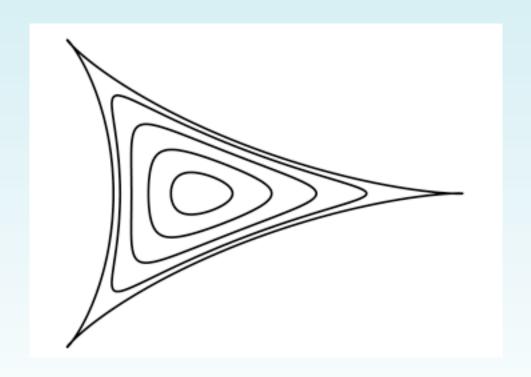
• Continuum limit = Laplacian Growth variational formulation

Why it's useful Laplacian Growth ...

Resolving finite-time singularities of Hele-Shaw flows (Saffman, Taylor, Sakai, Kadanoff, Bensimon, Howison, King, Tanveer, Crowdy, ...)

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$$\frac{\mathrm{d}z}{\mathrm{d}w} = 0, \quad \text{at } w = 1.$$

When it happens Laplacian Growth ...

A closer look at finite-time singularities

Non-trivial example: $t_3 \neq 0$, all others vanish:

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$$w'(z) \to \infty, \quad z \in \partial D$$

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Details of singularities Laplacian Growth ...

How to make a boundary cusp

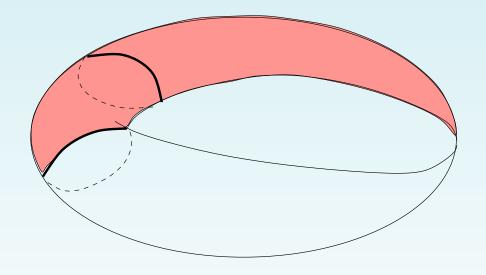
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Actually, ... interior branch point $w'(z) \to \infty$ meets exterior double point $S_1(z) = S_2(z)$



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Laplacian Growth and singular perturbations

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Various regularization attempts

• Surface tension: Saffman and Taylor

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- Both: Tanveer, Crowdy
- Often dynamics remains under-determined

Resolving singular hydrodynamics: stochastic model

hyperbolic type

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<u>Problem</u>: find the equivalent of Rankine-Hugoniot and Lax-Oleinik conditions for Laplacian Growth dynamics in a weak sense, from stochastic (RMT) formulation.

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Normal matrix model and biorthogonal polynomials

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Proper measures – biorthogonal polynomials

$$\int P_n(z) \overline{P_m(z)} e^{-N[|z|^2 - V(z) - \overline{V(z)}]} d^2z \sim \delta_{nm}$$

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Equivalent to spectral theory of Putinar and Gustafsson.

Circular symmetry: electrons in uniform magnetic field

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- "Raising and lowering" operators:

$$\sqrt{\frac{N}{N+1}}z\Psi_N = \Psi_{N+1}, \quad \frac{1}{\sqrt{N(N-1)}}\frac{\partial}{\partial z}\Psi_N = \Psi_{N-1}$$

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Circular symmetry: electrons in uniform magnetic field

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$$\Re \oint y(z, N) \mathrm{d}z = 0.$$

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Implementation Laplacian Growth ...

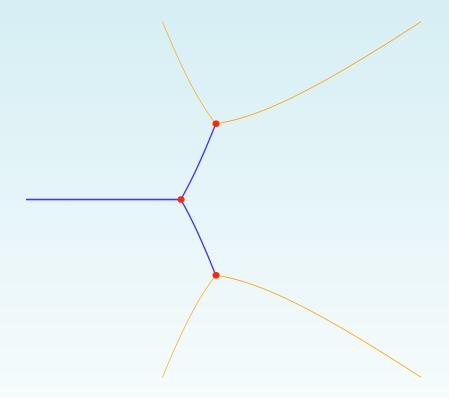
Cusps and horns, shocks and Stokes

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